

# Modelled trends in Antarctic sea ice thickness

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## Abstract

Unlike the rapid sea-ice losses reported in the Arctic, satellite observations show an overall increase in Antarctic sea ice concentration over recent decades. However, observations of decadal trends in Antarctic ice thickness, and hence ice volume, do not currently exist. In this study a model of the Southern Ocean and its sea ice, forced by atmospheric reanalyses, is used to assess 1992—2010 trends in ice thickness and volume. The model successfully reproduces observations of mean ice concentration, thickness, and drift, and decadal trends in ice concentration and drift, imparting some confidence in the hindcasted trends in ice thickness. The model suggests that overall Antarctic sea ice volume has increased by approximately  $30\text{km}^3/\text{y}$  ( $0.4\%/\text{y}$ ) as an equal result of areal expansion ( $20\times 10^3\text{km}^2/\text{y}$ , or  $0.2\%/\text{y}$ ) and thickening ( $1.5\text{mm}/\text{y}$ , or  $0.2\%/\text{y}$ ). This ice volume increase is an order of magnitude smaller than the Arctic decrease, and about half the size of the increased freshwater supply from the Antarctic Ice Sheet. Similarly to the observed ice concentration trends, the small overall increase in modelled ice volume is actually the residual of much larger opposing regional trends. Thickness changes near the ice edge follow observed concentration changes, with increasing concentration corresponding to increased thickness. Ice thickness increases are also found in the inner pack in the Amundsen and Weddell seas, where the model suggests that observed ice-drift trends directed towards the coast have caused dynamical thickening in autumn and winter. Modelled changes are predominantly dynamic in origin in the Pacific sector and thermodynamic elsewhere.

## 1. Introduction

Arctic sea ice extent has declined rapidly in recent decades ( $-52 \times 10^3 \text{ km}^2/\text{y}$  for 1979-2010), but Antarctic sea ice extent has slowly increased ( $+17 \times 10^3 \text{ km}^2/\text{y}$ ) over the same period (Cavalieri and Parkinson 2012; Comiso and Nishio 2008; Parkinson and Cavalieri 2012; Zwally et al. 2002), raising fundamental questions of why the two poles have evolved so differently in the context of climate change. The small overall Antarctic increase in ice area is actually the residual of a coherent pattern of much larger regional increases and decreases that almost compensate each other. These large local areal changes (up to 2% per year increase and decrease, or 60% total over 30 years; Turner et al. (2009)) can also be viewed as changes in the length of the ice season (up to 3 days per year, or 3 months in total; Stammerjohn et al. (2012)). The local changes are of the same magnitude as those in the Arctic, which does not feature the regions of ice expansion that, in the Antarctic, more than offset the regions of loss.

It is currently unclear exactly what causes the regional pattern of changes that produces the overall increase in ice cover. Proposed drivers include changes in atmospheric temperature or wind stress (Lefebvre and Goosse 2005; Liu et al. 2004; Turner et al. 2009), precipitation (Liu and Curry 2010), ocean temperature (Jacobs and Comiso 1997), atmosphere and ocean feedbacks (Stammerjohn et al. 2008; Zhang 2007), and increased freshwater flux from the Antarctic Ice Sheet (Bintanja et al. 2013). Recent work has shown that the trends in Antarctic ice concentration are associated with trends in ice drift, and that both are caused by changes in near-surface winds through a combination of dynamic and thermodynamic effects (Holland and Kwok 2012). However, the ultimate cause of the relevant wind changes remains uncertain.

The current generation of coupled climate models are unable to capture the increase in overall Antarctic sea ice extent, instead hindcasting a decline in ice cover of a similar magnitude to their modelled Arctic (Turner et al. 2012). This suggests that important deficiencies exist in our understanding of ice and climate physics that will be relevant to the prediction of climate at both poles. The model projections of most aspects of Antarctic climate are questionable if they cannot reproduce past observations of sea ice extent, since it is one of the better-monitored polar climate variables. Improved climate models are also required to answer top-level questions about past changes in Antarctic sea ice that are of vital importance to policymakers. For example, it is unclear why Antarctic sea ice is not rapidly declining in response to increased greenhouse-gas concentrations and depletion of stratospheric ozone, both of which are found to decrease Antarctic sea ice in coupled climate models (Bitz et al. 2006; Sigmond and Fyfe 2010). Several studies have suggested that the observed increase is an unlikely result of natural variability, which would consequently only be captured by a small proportion of simulations (Mahlstein et al. 2013; Polvani and Smith 2013; Swart and Fyfe 2013). However, this result is marginal, valid only for the annual-mean circumpolar trend (Swart and Fyfe 2013), and relies upon the models having realistic natural variability, which is not the case (Turner et al. 2012; Zunz et al. 2013). In this study we investigate the Antarctic ice trends further in a quest to provide additional insight into these model weaknesses.

A critical gap in our understanding of Antarctic sea ice and its trends is caused by the relative paucity of Antarctic ice thickness data. Though spatially widespread, in-situ observations are severely lacking in spatial and temporal detail (Worby et al. 2008). Ice thickness can be determined from satellite altimetry by measuring the ice freeboard and assuming that the ice is freely floating with some choice of ice, snow, and seawater properties. Radar altimeters

have provided a relatively long record of ice thickness in the Arctic, but are subject to variable snow penetration in the Antarctic that currently precludes the reliable determination of ice freeboard (Giles et al. 2008). The freeboard of Antarctic ice and snow can be accurately measured using laser altimeters, and this can be converted to ice thickness using independent estimates of snow thickness and snow and ice density (Markus et al. 2011; Xie et al. 2013; Zwally et al. 2008). Recent studies demonstrate that ice thickness can be derived to a reasonable level of accuracy using the simple assumption that the snow—ice interface is at sea level (Kurtz and Markus 2012; Ozsoy-Cicek et al. 2013). However, the available laser altimeter data are limited in temporal coverage, and therefore unable to provide reliable trends in ice thickness. Instead, we use a coupled ice—ocean model to investigate the ice thickness trends and their drivers.

Models have previously been used to study various sensitivities of Antarctic sea ice, including the effects of surface precipitation (Powell et al. 2005), winds (Stossel et al. 2011), and ice-shelf meltwater (Hellmer 2004). Models have also been used to assess linkages between sea-ice variability and large-scale climate modes (Lefebvre and Goosse 2005, 2008). Several such models have been validated against ice observations, including those of ice thickness, with notable success (Fichefet et al. 2003a; Losch et al. 2010; Timmermann et al. 2002; Timmermann et al. 2004; Timmermann et al. 2005; Timmermann et al. 2009). However, only a few model studies consider changes in Antarctic sea ice thickness or volume.

Proposing an ocean feedback on increasing Antarctic sea ice, Zhang (2007) simulated a 1979–2004 increase in ice volume of  $200 \text{ km}^3/\text{y}$ . The mean ice area of  $10^7 \text{ km}^2$  thus implies a Antarctic-mean thickening of  $2 \text{ cm/y}$ , or  $0.5 \text{ m}$  over the period, which seems unfeasibly large.

This simulation had many shortcomings: overestimation of annual-mean ice volume by a factor of 2 (Kurtz and Markus 2012); overestimation of area trend by a factor of 3; disagreement with observed spatial pattern of concentration trends; disagreement with observed temporal variability in total ice extent. Fichefet et al. (2003a) found an area increase of  $11 \times 10^3 \text{ km}^2/\text{y}$  over 1958-1999 but no appreciable trend in ice thickness, though considerable wind-driven decadal variability in ice thickness and area were identified. Fichefet et al. (2003b) investigated 1955-2001 area and volume trends, finding an overall decrease of  $9 \times 10^3 \text{ km}^2/\text{y}$  and increase of  $11 \text{ km}^3/\text{y}$  respectively. However, reanalysis-forced models should be treated with extreme caution prior to the onset of satellite sounding data assimilation in late 1978 (Bromwich and Fogt 2004), and the latter model produces no trend in ice area during 1978-2001. Timmermann et al. (2005) report little modelled trend in ice area or volume during 1977-1999, attributing this to their spin-up technique of repeating the reanalysis forcing twice. Timmermann et al. (2009) model an ice area increase of  $11 \times 10^3 \text{ km}^2/\text{y}$  for 1979-2006 but do not report the corresponding volume trend. Crucially, the latter four studies do not show the spatial distribution of ice concentration trends, so it is impossible to assess whether the physical processes driving their overall trends are realistic.

A recent modelling study by Zhang (in press) specifically investigates the effect of changes in winds on Antarctic ice volume. The study finds an increase in ice volume of  $69 \text{ km}^3/\text{y}$  over 1979-2010, but at  $15 \times 10^3 \text{ km}^3$  the annual mean ice volume in this model is approximately twice that inferred from observation (Kurtz and Markus 2012), which casts significant doubt on the value of the volume trend. Since the ice extent is reasonable, this implies that the ice thickness is approximately twice the true value. The study does not examine in detail the changes during different seasons, in different regions, or the thermodynamic and dynamic mechanisms underlying the changes.

Probably the most reliable estimate of recent ice volume trends are from the model of Massonnet et al. (2013), which formally optimises the estimate by assimilating ice concentration data using an ensemble Kalman filter. The results show an overall 1980—2008 increase in ice volume of  $36 \pm 34 \text{ km}^3/\text{y}$ , with a regional pattern of ice-thickness trends that are closely related to the changes observed in ice concentration. The use of data assimilation has strengths and weaknesses; the results should be quantitatively as reliable as possible, but the adjustments made to the model state vector do not have a directly physical origin, and none of the ice or ocean variables are conserved (Massonnet et al. 2013; Mathiot et al. 2012). This implies that the physical processes underlying any ice thickness changes cannot be examined. Also, the need to run an ensemble of models limits the resolution possible in each case; Massonnet et al. (2013) run 25 ensemble members at  $2^\circ$  resolution.

The goal of this paper is to produce a high-resolution, free-running, observationally validated hindcast of trends in Antarctic sea ice thickness and volume. This study is complementary to those of Massonnet et al. (2013) and Zhang (in press); the results will not be quantitatively perfect but the use of a free-running (non-data-assimilating) model ensures that thickness trends are the result of calibrated model physics, which we examine in temporal and spatial detail. We place particular emphasis on a detailed assessment of our model results against satellite observations of the mean fields of Antarctic ice concentration, drift, and thickness, and the trend fields of ice concentration and drift. This validation provides a clear view of the relative confidence in the hindcasted ice thickness trends in different regions and seasons.

## **2. Methods**

We use revision c62r of the MITgcm (<http://mitgcm.org>) in a regional model of all ocean, sea ice, and ice shelves south of 30°S. The ocean component solves the Boussinesq Navier–Stokes equations on a generalised curvilinear grid using an Arakawa C-grid finite-volume discretisation and z-levels in the vertical (Marshall et al. 1997). All components use the same mesh, with a locally isotropic horizontal resolution of 0.25° in longitude, producing approximately square cells ranging from ~10 km on each side at 70°S to ~18 km at 50°S. The ocean component has 50 vertical levels ranging from 10-m resolution over the top 100 m to 457 m in the layer beneath 5461 m, though the step-like representation of seabed and ice-shelf topography is alleviated by the use of partial cells (Adcroft et al. 1997). Horizontal diffusivity is parameterised following Gent and McWilliams (1990) with a variable diffusivity (Visbeck et al. 1996) (limited to maximum 300 m<sup>2</sup> s<sup>-1</sup>) and slope-clipping (Large et al. 1997). Horizontal viscosity is flow-dependent (Leith 1996). Vertical mixing is parameterised according to the ‘K-profile parameterisation’ (KPP) scheme (Large et al. 1994), which combines representations of ocean internal mixing and the surface mixed layer, exerting a significant influence upon the sea ice. A fully non-linear equation of state is used (McDougall et al. 2003).

The sea-ice component (Losch et al. 2010) is also formulated on a C grid. In this study we use an Elastic-Viscous-Plastic procedure to solve for ice dynamics with an elliptic yield curve. Free-slip conditions are applied at boundaries, and ice stress is applied directly to the surface of the ocean. Ice thermodynamics are treated using the ‘zero layer’ approach, employing a constant thermal conductivity and linear temperature profile within the ice (Semtner 1976). The model has only two prognostic ice classes (ice and water) but a linear distribution of 7 thickness classes is used in the thermodynamic calculations. A prognostic snow layer floods into ice if depressed below sea level. Ice salinity is neglected entirely,



which implies a slight over-prediction of freshwater fluxes because sea ice is in reality slightly saline. All prognostic variables are transported using first-order upwind advection. Far more sophisticated physical treatments of ice processes are available (Hunke and Lipscomb 2010), and it would be instructive to examine the effect of those in a future study, but the sea ice model is demonstrably able to reproduce the relevant ice observations (see below), so we are confident that its features are sufficient to support the conclusions of this study.

Initial conditions for ocean temperature and salinity are taken from the World Ocean Atlas (Boyer et al. 2009) (extrapolating southwards where required) and seabed and ice-shelf topography is taken from the RTOPO dataset (Timmermann et al. 2010). Steady climatological boundary conditions are applied at 30°S, with temperature and salinity taken from the World Ocean Atlas and ocean velocities taken from the ECCO2 reanalysis (Menemenlis et al. 2005). The ocean and sea-ice surfaces are forced using 6-hourly fields from the ERA-Interim reanalysis (Dee et al. 2011) at a resolution of 1.5° in both longitude and latitude. The forcing variables consist of zonal and meridional 10-m winds, 2-m air temperature and specific humidity, downward shortwave and longwave radiation, air pressure loading and precipitation. The pressure loading and thermodynamic interactions of static ice shelves are also included (Losch 2008). Iceberg melting is a significant source of freshwater to the Southern Ocean that occurs in a heterogeneous pattern depending upon the distribution of the bergs. We experimented with deriving this flux from third-party model fields, but these were completely dependent upon the modelled bergs and could never be truly representative of the time period used. Therefore, iceberg melting was represented simply by distributing a freshwater flux of 2000 Gt/y uniformly around the coast (Jacobs et al. 1992). No ocean salinity restoring is used.

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196 The paucity of in-situ atmospheric data over the Southern Ocean means that reanalysis  
197 forcing data contain significant biases prior to the onset of satellite sounding data assimilation  
198 in late 1978 (Bromwich and Fogt 2004). Therefore, the model is first spun-up by repeating  
199 1980 forcings 10 times, and then run forward from 1981 until the end of 2011. Starting the  
200 simulations in January avoids the need for any initial sea-ice distribution. Validation of the  
201 model against observed ice trends is essential to impart confidence in the modelled ice  
202 thickness trends, so we analyse only the period 1992—2010, for which reliable data of trends  
203 in ice concentration and drift are available (Holland and Kwok 2012). This provides a total  
204 of 22 years of model spin-up time, and we are confident that the trends presented are the  
205 result of the atmospheric forcing, not ocean adjustment from initial conditions. In particular,  
206 a test simulation in which the 1980 forcings were repeated for 40 years shows no significant  
207 sea-ice trends after year 20.

208

209 The model validation requires observations of ice variables on an Antarctic-wide scale. Such  
210 observations do not exist directly, but can be derived from quantities observable by satellite.  
211 Daily ice concentration data generated from passive microwave emissions using the  
212 Bootstrap algorithm are used, with all values below 0.15 masked (Comiso 2000). Ice drift  
213 data generated by feature-tracking in the same passive microwave data are also available  
214 daily for the entire period, though only from April—October due to a high rejection rate of  
215 data in the Austral summer (Holland and Kwok 2012; Kwok et al. 1998). The only  
216 comprehensive ice thickness data available on the Antarctic-wide scale are from ICESat laser  
217 altimetry campaigns, covering 1—3 one-month-long periods per year for 2003—2008 (Kurtz  
218 and Markus 2012). These ice- and snow-thickness data are derived from measurements of  
219 freeboard and the assumption that the snow—ice interface is at sea level; i.e. that all

freeboard is snow and all draft is solid ice. This assumption is highly questionable in detail, but appears to provide a reasonable level of agreement with in-situ observations overall (Kurtz and Markus 2012; Ozsoy-Cicek et al. 2013; Worby et al. 2008).

Various definitions of ‘ice thickness’ are used in the literature. Throughout this study, ‘effective ice thickness’ is defined as the volume of ice per unit area of ocean, which is the quantity conserved by the model, while ‘average ice thickness’ is used to refer to the volume of ice per unit area of ice, which is closer to the quantity measured in the field. Effective ice thickness is the product of the average ice thickness and the ice area concentration. We generally investigate fields of effective ice thickness because that is the quantity most relevant to the overall changes in ice volume, but the Antarctic-wide average ice thickness is also examined. We consider the thickness of ice only, rather than including the ice-borne snow layer, because the ice component is of greater interest to many scientific questions, and is also better constrained in our model, which uses uncertain reanalysis precipitation fields to generate ice-borne snow. We consider seasonal maps of means and trends calculated from monthly-mean model output. Mean fields for each season are the overall average of all appropriate months from all years. To produce trend fields, for each grid point we first convert the model output into a timeseries of season-mean values, and then calculate the interannual trend for each season from the appropriate seasonal values over the different years. For example, to calculate the trend in winter ice concentration, we create fields of the mean ice concentration for each winter and then plot, at each grid point, the interannual trends in those fields.

### **3. Results**

Before examining our results it is worth considering the extent to which we would expect real ice thickness trends to be represented in a free-running hindcast model. In any model forced by atmospheric reanalyses, ice extent (the ocean area covered by an ice concentration of at least 0.15) should be well-captured; reanalysis models use observed ice concentration in their surface boundary condition, so the ice is imprinted onto their near-surface fields and then recreated in the forced ocean model. However, hindcasting ice area (the area integral of ice concentration) and thickness, hence volume, is more challenging. Antarctic ice drift is dominated by surface winds, and ERA-Interim is known to capture the appropriate wind trends (Holland and Kwok 2012). ERA-Interim air temperatures (Bracegirdle and Marshall 2012) and our model ocean temperatures (see below) are also reasonable, implying little limitation on the ice hindcast. However, ice concentration and (crucially) thickness are strongly affected by snow cover (Powell et al. 2005) and ocean freshwater fluxes (Hellmer 2004; Zhang 2007), both of which are limited by the large uncertainty in reanalysis precipitation fields (although ERA-Interim is among the best, according to Bromwich et al. (2011)). Also, any convergence-driven dynamical ice thickening will be determined by the assumed rheology of the ice, of which model treatments are uncertain (Feltham 2008; Tsamados et al. 2013). We therefore expect modelled ice thickness trends to be affected by poorly-constrained details of the forcing and models. As a result, we perform a qualitative assessment of our model results against existing observations, and consider broad patterns of ice thickness change rather than quantitative predictions for specific regions, which are perhaps better-provided by the data-assimilating model of Massonnet et al. (2013).

### **3.1 Modelled Ocean Mean State**

Since the ocean state and trends can potentially have a significant effect on sea ice, we first assess the mean state of our modelled ocean over the period of interest, 1992-2010 (Figure 1).

The long-term mean barotropic streamfunction of the model (Figure 1a) reproduces the observed path of the Antarctic Circumpolar Current (Orsi et al. 1995; Sokolov and Rintoul 2009) and, crucially, also captures the shape and strength of the subpolar Weddell and Ross gyres (Wang and Meredith 2008). Thus, to the extent permitted by the sparse available data, we can have some confidence that the dynamic coupling between ocean and ice is accurate.

The thermodynamic interaction is harder to verify, since there are very few relevant observations of the ocean beneath Antarctic sea ice. Most of our knowledge of ice-ocean interaction comes from summertime observations of the remnant Winter Water and shelf waters formed by winter sea-ice production. As summarised by Petty et al. (submitted), these observations show that in the Weddell and Ross seas the surface mixed layer extends to the seabed in winter, filling the shelf seas with cold and saline shelf waters, while in the Amundsen and Bellingshausen seas the winter mixing only produces a shallower layer of Winter Water, beneath which warmer Circumpolar Deep Water is allowed to persist on the shelf. The mean winter mixed-layer depth (Figure 1b) predicted by the KPP scheme (defined as the shallowest depth for which the overlying bulk Richardson number equals 0.3) shows that the model is able to reproduce these features, with complete destratification in the Weddell and Ross seas and progressively shallower convection in the Amundsen and Bellingshausen seas. This is also reflected in the long-term mean temperature and salinity at the seabed, which shows warm and relatively fresh Circumpolar Deep Water in the Amundsen and Bellingshausen seas and cold and saline shelf waters in the Weddell and Ross seas (Figures 1c and 1d). Further offshore, the winter mixed layer shallows over the sea-ice zone due to a reduction in surface stress and buoyancy forcing, and then deepens offshore of the ice edge. Thus, the vertical structure of the water column seems to compare well to the

limited observations that exist, and we infer that the thermodynamic ice-ocean interaction is reasonable as far as it can be tested.

### **3.2 Modelled Ice Mean State**

We next compare the mean state of our modelled Antarctic sea ice to observations over the period of interest, 1992-2010. A comparison of mean ice concentration by season (Figure 2) shows that the modelled ice concentration in Austral autumn and winter are very good, which is critical because these seasons have the largest observed ice concentration trends (Turner et al. 2009) and are best covered by ice motion data. Concentrations in spring and summer are not as good, with two persistent problems. Firstly, the model fails to capture a ‘halo’ of low ice concentration near 0°E in spring (Lindsay et al. 2004), which leads to excessive summer ice concentration in the eastern Weddell Sea. The halo is thought to be caused by upward deformation of warm isopycnals near the Maud Rise seamount (de Steur et al. 2007), which is a challenging feature to capture accurately in a large-scale z-level ocean model. Attempts were made to produce this feature using a variety of ocean mixing schemes, but these resulted in open-ocean convection and a large polynya in the region (Timmermann and Beckmann 2004), strongly degrading the agreement with observations. Secondly, low ice concentrations in the Ross Sea polynya are poorly represented in both spring and summer. Northward ice export in this region is reasonable (see below), so this problem is due to excessive importation of ice from the east.

A similar comparison of effective ice thickness (Figure 3) shows reasonable results, although some ice concentration errors are also apparent in effective thickness. The model captures the general magnitude of ice thickness and correctly produces thicker ice in the Weddell, Bellingshausen, and Amundsen seas, though the spatial patterns within each region are

imperfect. The model under-represents the thickest ice in the north-west corner of the Weddell Sea, though this problem is minimal in autumn, the season of greatest interest here. Ice is too thick in the eastern Weddell Sea, in accordance with the aforementioned lack of halo in this region, and the model over-predicts effective ice thickness in the Ross Sea polynya in all seasons. A similar validation of effective snow thickness (Figure 4) is perhaps worse, with the model failing to reproduce the correct thicknesses in summer and autumn, and producing the wrong pattern in the Weddell Sea in spring. This is unsurprising given the uncertainty surrounding reanalysis precipitation fields, but does place a limitation on our results because snow flooding is an important component of Antarctic sea ice growth (Powell et al. 2005). The model produces a relatively good representation of effective snow thickness in the Pacific sector in spring.

Given the model's better performance in autumn and winter, and the larger ice trends and greater availability of data in those seasons, the rest of this study concentrates primarily on those seasons. Figure 5 shows the mean ice velocities predicted by the model, which agree with the observations rather well. The focussed northward ice export from the Ross Sea and widespread export in the Weddell Sea are reproduced well, as is the westward coastal current around East Antarctica. Ice drift is a little too rapid near coastlines and the ice edge. This may be a feature of the coarse sampling of the ice observations in these regions, but is more likely to be inaccuracy in the modelled ice dynamics (Uotila et al. submitted). Near the coast this could be caused by problems with the coarse wind forcing or ice rheology. The over-zealous coastal current in the Pacific sector transports too much ice from the Bellingshausen and Amundsen seas into the Ross Sea, explaining the excessive ice concentration in the latter.

The modelled seasonal cycle in total Antarctic ice area (the area integral of ice concentration) compares extremely well with observations (Figure 6a), which is an important result because ice area is much harder to reproduce in a model than ice extent. The mean cycle of total Antarctic ice volume (Figure 6b) is also in excellent agreement with the data that exist. The modelled Antarctic-wide average ice thickness (total ice volume divided by total ice area; Figure 6b) is remarkably constant throughout the year, varying by less than 20%. This implies that autumn/winter ice thickening is offset by the growth of large areas of thin ice, and spring/summer ice thinning is offset by the melting of large areas of thin ice. The observations suggest the possibility that thicker ice in summer is missed by the model, but this is uncertain because the observations are derived with different assumed values for snow density in each season. If a uniform snow density were used for all seasons, the derived ice thickness would be larger in spring and smaller in summer, in closer agreement with the model.

### **3.3 Modelled Ice Trends**

Figure 6 also provides an overview of modelled and observed trends in Antarctic sea ice. Monthly anomalies of ice area from the mean seasonal cycle for the respective datasets are remarkably consistent between model and observations (Figure 6c), with a few exceptions, leading to a good prediction of the overall magnitude of the area trend. Given the difficulty inherent in hindcasting ice area, this is an encouraging result that leads to some confidence in the modelled trends. Building on this confidence, Figure 6d shows a primary conclusion of this model study, that overall Antarctic ice volume and Antarctic-wide average ice thickness have both increased over 1992-2010. The overall volume increase of  $29 \text{ km}^3/\text{y}$  is in good agreement with the central Massonnet et al. (2013) estimate of  $36 \text{ km}^3/\text{y}$  for 1980—2008 using data assimilation. The ice volume anomaly timeseries largely follows that of ice area



(Figure 6c), but there are several occasions where anomalies in average ice thickness contribute significantly to ice volume, such as in the prolonged negative anomaly in both variables between 2002 and 2004. As fractions of their mean annual values, the increases in Antarctic average ice thickness ( $1.5 \text{ mm/y} / 0.7 \text{ m} \sim 0.2 \text{ \%/y}$ ) and total area ( $20 \times 10^3 \text{ km}^2/\text{y} / 10^7 \text{ km}^2 \sim 0.2 \text{ \%/y}$ ) contribute equally to the trend in ice volume ( $30 \text{ km}^3/\text{y} / 7 \times 10^3 \text{ km}^3 \sim 0.4 \text{ \%/y}$ ). The Antarctic average ice thickness trend produces a feasible increase of 2.6 cm over the period considered. It is noteworthy that the simulation of Zhang (in press) produces a similar fractional trend in ice volume (0.46 %/y) despite having ice that is approximately double the observed thickness; this suggests that the Zhang (in press) thickness and volume trends are approximately twice the real value (since the extent trend is accurate in that study).

These overall timeseries hide a strong pattern of regional variation in the trends, much of which compensate, so that the overall Antarctic-mean trends are the residual of much larger regional changes. Figure 7 compares, by season, the maps of linear trend in modelled and observed ice concentration. The general agreement is exceptionally good, with the model clearly reproducing the wave-like pattern of ice concentration trends during this period: decreasing ice cover in Bellingshausen, Weddell, and Mawson seas, and increasing ice cover in Ross, Amundsen, and Cosmonaut seas (Holland and Kwok 2012). The model trends are least reliable in summer, which is unsurprising given the above validation of mean ice concentration in this season. It is interesting to note that the modelled concentration trends seem to be shifted eastwards relative to the observed trends. We cannot be sure why this is, but speculate that the reanalysis winds place the climatological lows in the circumpolar pressure trough (and thus their trends) too far east as a result of poorly representing the deepening of low pressure systems as they navigate Antarctic topography.

We again restrict our attention to autumn and winter, and investigate the agreement of trends in ice drift between model and observations (Figure 8). Since ice thickness is strongly affected by convergence and divergence, it is essential to have confidence in our modelled ice-drift trends if we are to believe our modelled thickness trends. As shown in Figure 8, the dynamical trends in autumn are in good agreement with observations, particularly considering how challenging it is to correctly model ice velocities, let alone their linear trend. This agreement is largely the result of accurate surface wind trends in ERA-Interim (Holland and Kwok 2012). In autumn the model correctly produces the observed decadal increase in northward ice export in the Ross, Amundsen, and Cosmonaut seas, and the observed decrease in northward export in the Weddell and Mawson seas (Holland and Kwok 2012). Wind and ice-dynamical trends in winter do not fit the observations quite as well, but the broad features of a southward trend in the Bellingshausen Sea and northward trend around 0°E are found in both model and observations.

These observational assessments of modelled trends in ice concentration and velocity allow us to critically consider the pattern of trends in effective ice thickness (Figure 9) that cause the overall increase in Antarctic sea ice volume. It is immediately apparent that the regional trends in effective ice thickness are at least an order of magnitude larger than the Antarctic-mean trend (Figure 6), which is their residual. The largest effective thickness trends (up to 5 cm/y) are found in the Amundsen Sea in winter. This further demonstrates that, while overall Antarctic ice trends may be subtle, the local changes can be of a considerable magnitude. Unsurprisingly, we find that around the ice edge the spatial distribution of effective ice thickness trends (Figure 9) mimics the trends in ice concentration (Figure 8), although there are differences in the relative magnitude of these trends. More importantly, the model also produces effective ice thickness trends in the internal ice pack near the coast, which are not

apparent in the concentration trends because the ice is close to full cover throughout the periods considered. These ‘internal’ thickness trends have the largest regional magnitudes, and are an important finding of this study. There are three main regions of internal ice thickness increase: the northwest Weddell Sea in autumn, southern Weddell sea in autumn and winter, and the Amundsen and Bellingshausen seas in winter. Similar trends appear in the model results of Massonnet et al. (2013) and Zhang (in press), though their seasonal structure and physical origin have not been fully examined.

It is important to note that the maps of trend in effective ice thickness (volume ice per area ocean) are nearly identical to maps of trend in average ice thickness (volume ice per area ice). Away from the ice edge the concentration remains near full cover throughout, so the effective and average thickness are practically the same. Near the ice edge the average ice thickness is of order 10 cm, so the observed changes in ice concentration alone, of order 1%/y, would give a change in effective ice thickness of order 1 mm/y. This is negligible compared to the modelled effective ice thickness changes of order 1 cm/y, which are therefore demonstrated to be the result of large changes in average ice thickness. In other words, the trends in effective ice thickness (volume ice per area ocean) near the ice edge in Figure 9 are negligibly affected by the trends in ice concentration (area ice per area ocean) in Figure 8; they are instead almost entirely trends in average ice thickness (volume ice per area ice). To investigate these trends further we now consider a diagnostic decomposition of the ice-thickness equation.

### **3.4 Analysis of ice trends**

An overview of the processes governing the evolution of effective ice thickness can be obtained by separating the total tendency of effective thickness into dynamic and thermodynamic parts. Effective thickness is governed by a simple conservation equation

$$\frac{\partial h}{\partial t} = -\nabla \cdot (\mathbf{u}h) + f$$

where  $h$  is effective thickness and  $\mathbf{u}$  is velocity. The first term on the right-hand side is the thickness change caused by ice-flux divergence, as determined by the momentum balance, while  $f$  is the change in thickness due to thermodynamic processes. We record the values of each of these terms separately, and the total tendency, in the ice code. Examination of the mean fields of these tendency terms is highly instructive, as shown in an observational assessment by Holland and Kwok (2012), but here our purpose is to assess trends in ice thickness, for which we assess trends in the tendency terms. This analysis is performed for autumn and winter only, the seasons for which we have greatest confidence in the model results.

As with all such calculations, maps of interannual trend in the tendency terms are generated by constructing seasonal means of the terms at each grid point and then calculating the interannual trend in the values for each season. The tendency terms represent the rate of change of effective ice thickness during a particular season, so our calculated trends represent the change in that rate over the decadal time period considered. For this reason, the trends in effective ice thickness (e.g. Figure 10a) do not exactly match trends in effective ice thickness tendency (e.g. Figure 10b). The former is the trend in mean autumn effective ice thickness, while the latter is the trend in the mean change in effective ice thickness over autumn. For example, some of the trends in autumn ice thickness are caused by thicker ice being present at the end of summer, and this would cause the two quantities to disagree. However, trends in the autumn effective thickness tendency (Figure 10b) do explain many of the features in

the autumn effective thickness trend map (Figure 10a). The only significant regions of disagreement are the areas of ice thickness increase in the southern Amundsen and Ross seas and northwest Weddell Sea, which are therefore revealed to be the result of summertime trends. The model performance is imperfect in summer, so these features should be treated with caution.

The majority of the trends in effective ice thickness (Figure 10a) are reflected in the trends in effective thickness tendency (Figure 10b), which we can decompose exactly into dynamic (Figure 10c) and thermodynamic (Figure 10d) parts. This decomposition reveals that the trends in the Pacific sector are mostly explained by changes in ice dynamics (compare Figures 10b and 10c). The autumn thickness trend in the southern Weddell Sea is also caused by dynamics, but the thinning in the northern Weddell Sea, and most of the changes around East Antarctica, are due to thermodynamic changes. Changes in wind stress (Figure 10a) succinctly explain all of these changes. In the Amundsen and Ross seas, increased northward ice transport in autumn causes thinning in the south and thickening in the north. In the Bellingshausen Sea, a southward trend in wind stress causes the exact opposite, a loss of ice from the ice edge and a strong thickening near the coast. In the Weddell Sea a decrease in northward ice export away from the coast causes strong thickening. The thermodynamic ice loss to the north could be a result of the decreased export of cold and dry air from Antarctica, or perhaps a southward shift of the warmer waters of the ACC, either of which could be caused by the wind trends. The remaining trends all follow the same pattern of increased (decreased) northward wind stress causing ice thickness increase (decrease) near the ice edge, through a varying combination of changes in air-ice drag and cold- or warm-air advection. These results are in complete agreement with the analysis of Holland and Kwok (2012), who used observations to perform an autumn decomposition of the conservation equation for ice

concentration. Wind-driven ice convergence and a resultant thickening in the Pacific sector and southern Weddell Sea were also obtained by Zhang (in press). Finally, we note that the decomposition suggests an increased ice divergence and thermodynamic ice growth in the Ross Sea coastal polynya (Figures 10c and 10d), and a decrease in divergence and growth in the Ronne polynya, Weddell Sea, both in agreement with observed trends (Drucker et al. 2011).

The results in winter (Figure 11) illustrate the difference between trends in effective ice thickness and effective ice thickness tendency. In this season few of the large ice thickness trends (Figure 11a) are observed in the tendency terms (Figure 11b), implying that the thickness trends are the result of changes occurring in previous seasons. For example, the ice thinning trend in the northern Weddell Sea (Figure 11a) is revealed as being a lasting effect of previous seasons; the trend in winter tendency (figure 11b) is towards thickening. On average, there is thinner ice in the northern Weddell Sea during winter, but this ice is thickening more during winter. The ice is thickening less during autumn, and the ice remains thinner during winter as a result. The increased thickening during winter is revealed as being dynamical in origin (figure 11c), because the wind trend in this region is towards increased northward flow (figure 11a).

Some effective thickness trends that are very clearly caused by wintertime changes are in the Bellingshausen and Amundsen seas, where strong wind trends towards the south lead to a significant winter thickening of the ice near the coast that is entirely dynamic in origin (Figure 11). It is virtually certain that these thickening trends have occurred in reality, since they are the logical extension of known trends in ice concentration, winds, and ice drift in this region (Holland and Kwok 2012; Turner et al. 2009). The model is clearly responding

sensibly to the wind stress it receives from ERA-Interim (Figure 11a). However the magnitude and pattern of this thickening must be regarded as merely indicative, for two reasons. Firstly, the ice model cannot be expected to convert wind stress changes into ice thickness changes with a high level of quantitative skill, because this process is heavily dependent upon the poorly constrained rheological properties of the ice (Feltham 2008; Tsamados et al. 2013). Secondly, the detailed pattern of the southward trend in modelled ice motion in this region in winter is imperfect (Figure 8); the observed ice drift trend is towards the Antarctic Peninsula, while the reanalysis wind stress trend (Figure 11a) drives the ice towards the coast in the eastern Bellingshausen Sea and the Amundsen Sea. However, ice drift trends in autumn are well-represented (Figure 8), and these do drive ice westwards in the observations. In summary, the observations strongly support a significant coastal ice thickening in this region, but the model may place it too far east, and with an uncertain magnitude. Massonnet et al. (2013) also model a narrow zone of coastal thickening in this region; Zhang (in press) does not.

#### **4. Discussion**

The model results presented here reproduce observations of mean ice concentration, drift, and thickness, and trends in ice concentration and drift. The simulated ice thickness trends also agree with those of Massonnet et al. (2013), which can be regarded as a ‘best estimate’ due to their use of data assimilation. This gives us confidence that the physical processes in the model reflect those operating in reality, offering insight into the processes causing trends in Antarctic sea ice. Holland and Kwok (2012) showed that autumn ice concentration trends are dominated by dynamics in the Pacific sector of the Southern Ocean and thermodynamics elsewhere; this modelling study shows that the same pattern holds for ice thickness, and hence ice volume, in autumn and winter.

539

540 This finding has significant consequences. Ice dynamical changes can occur either because  
541 the driving stresses have changed, or because the ice is responding differently to a constant  
542 stress. The latter can occur if the ice thins, since weaker ice responds more readily to an  
543 applied stress, and this is the case in the Arctic, where the ice is accelerating in excess of  
544 trends in wind forcing (Kwok et al. 2013). In the Antarctic the trends in ice motion and wind  
545 agree closely (Holland and Kwok 2012) and the thickness changes modelled here are much  
546 smaller. Thus, the ice-dynamical changes can only ultimately be caused by changes air-ice  
547 drag and/or ocean-ice drag, which both ultimately result from changes in the winds since  
548 surface ocean currents are predominantly wind-driven. The dynamic origin of the modelled  
549 changes in the Pacific sector in autumn and winter therefore implies little or no contribution  
550 from changes due to precipitation (Liu and Curry 2010), feedbacks (Stammerjohn et al. 2012;  
551 Zhang 2007), or atmosphere or ocean warming (Jacobs and Comiso 1997; Lefebvre and  
552 Goosse 2005; Liu et al. 2004). This certainly does not rule out a contribution from these  
553 mechanisms in summer and spring, or around East Antarctica. A detailed analysis of the  
554 trends in ice thermodynamics, in a model capable of accurately representing the warmer  
555 seasons, is clearly required to advance this question.

556

557 The results also suggest that it is unlikely that increased ice-sheet melting is implicated in the  
558 Antarctic sea ice increase, as proposed by Bintanja et al. (2013). The vast majority of  
559 increased freshwater discharge from the Antarctic Ice Sheet has entered the Amundsen Sea  
560 (Shepherd et al. 2012) and followed the coastal current westward into the Ross Sea, where it  
561 has caused a significant freshening (Jacobs and Giulivi 2010). If ice-shelf meltwater were to  
562 contribute to the sea-ice trends, the largest effect would thus be expected to occur in the  
563 increasing ice volume in the western Pacific. Our results, and the observational analysis of



Holland and Kwok (2012), show quite clearly that the trends in that region are predominantly dynamic in origin in autumn and winter. In addition, the model presented here has no overall trend in ice-sheet meltwater input (the prescribed iceberg discharge is steady, and total ice-shelf melting contains no significant trend), yet is able to reproduce most features of the observed Antarctic ice concentration increase. Thus our results are in agreement with the study of Swart and Fyfe (2013), who found that the Antarctic sea ice trends were not affected by trends in Antarctic Ice Sheet freshwater flux.

## **5. Conclusions**

There are no observations of decadal trends in Antarctic sea ice thickness and volume, so we hindcast them for the period 1992—2010 using a numerical ice—ocean model that is extensively validated against observations. The model accurately simulates mean fields of ice concentration, drift, and thickness in autumn and winter, and reproduces observed trends in ice concentration and drift. This validation allows us to hold some confidence in the corresponding modelled trends in ice thickness.

Unsurprisingly, the model shows that the observed ice-concentration trends near the ice edge have corresponding trends in ice thickness, with areas of increasing thickness associated with increasing concentration. Model diagnostics show that these thickness trends are driven dynamically in the Pacific sector and thermodynamically elsewhere, in agreement with an observational decomposition of ice concentration trends (Holland and Kwok 2012). The model also reveals that the observed southward trends in ice drift in the Bellingshausen and Weddell seas have caused ice to thicken near the coast, a trend that does not appear in ice concentration measurements because the ice remains at full cover throughout. The Weddell Sea thickening occurs in response to decreased export early in the year, while the

Bellingshausen Sea thickening occurs in winter due to a strong trend towards southward ice flow. These results are the logical extension of known trends in ice concentration, winds, and ice drift. The dynamic origin of the autumn and winter trends in the Pacific sector imply that they must be forced by changes in the winds, rather than other atmospheric or oceanic forcings or feedbacks.

Spatial patterns of increasing and decreasing trends in ice concentration and thickness largely compensate, so that neither variable has a large Antarctic trend overall. Thickening in the interior of the ice pack enhances the overall thickness trend relative to the concentration trend. As fractions of their mean annual values, the modelled increases in Antarctic-wide ice thickness ( $1.5 \text{ mm/y} \sim 0.2 \text{ \%/y}$ ) and area ( $20 \times 10^3 \text{ km}^2/\text{y} \sim 0.2 \text{ \%/y}$ ) contribute equally to the overall trend in ice volume ( $30 \text{ km}^3/\text{y} \sim 0.4 \text{ \%/y}$ ). This small gain contrasts markedly with the observed Arctic sea ice volume loss of  $500\text{--}1000 \text{ km}^3/\text{y}$  ( $\sim 3\text{--}6 \text{ \%/y}$ ) (Kwok and Rothrock 2009; Laxon et al. 2013). In terms of Southern Ocean freshwater forcing, the small increase in sea ice freshwater extraction is outweighed by the  $\sim 70 \text{ km}^3/\text{y}$  increase in freshwater input from the Antarctic Ice Sheet (Shepherd et al. 2012).

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## Figure Captions

Figure 1: Modelled mean 1992-2010 ocean fields. a) Barotropic stream function (contours every 10 Sv, magenta contour 0 Sv), b) Winter (JJA) mean mixed-layer depth from KPP calculation (contours every 25 m, magenta contour 100 m), c) Potential temperature at seabed (contours every 0.2 °C, magenta contour 0 °C), d) Salinity at seabed (contours every 0.025, magenta contour 34.65).

Figure 2: Modelled and observed 1992-2010 mean ice concentration by season. Observed ice concentration is calculated using the Bootstrap algorithm (Comiso 2000). WS: Weddell Sea, CS: Cosmonaut Sea, MS: Mawson Sea, RS: Ross Sea, AS: Amundsen Sea, BS: Bellingshausen Sea.

Figure 3: Modelled mean 1992-2010 effective ice thickness and observed mean 2003-2008 effective ice thickness by season. Effective ice thickness is defined as volume of ice per unit area of ocean, neglecting the ice-borne snow layer. Observed effective ice thickness is derived from ICESat measurements (Kurtz and Markus 2012). Areas with respective ice concentration below 0.5 are masked in both datasets.

Figure 4: Modelled mean 1992-2010 effective snow thickness and observed mean 2003-2008 effective snow thickness by season. Effective snow thickness is defined as volume of ice-borne snow per unit area of ocean. Observed effective snow thickness is derived from ICESat measurements (Kurtz and Markus 2012). Areas with respective ice concentration below 0.5 are masked in both datasets.

808

809 Figure 5: Modelled and observed 1992-2010 mean ice concentration and ice drift for autumn  
810 and winter seasons. Observed ice concentration is calculated using the Bootstrap algorithm  
811 (Comiso 2000) and ice velocities are from passive microwave feature-tracking (Holland and  
812 Kwok 2012). Model velocities are shown every tenth grid point.

813

814 Figure 6: 1992-2010 temporal variability of total Antarctic sea ice variables from model and  
815 observation. a) mean seasonal cycle in total ice area (the area integral of ice concentration)  
816 for model and observations (Comiso 2000). b) mean seasonal cycle in total ice volume and  
817 mean ice thickness (total ice volume divided by total ice area) for model and observations  
818 (dots represent individual ICESat campaigns, shaded areas represent interannual mean  $\pm$   
819 standard deviation for each season; Kurtz and Markus (2012)). c) monthly anomalies in  
820 modelled and observed total ice area from respective climatologies in panel a. d) monthly  
821 anomalies in modelled total ice volume and mean ice thickness from respective climatologies  
822 in panel b. All trends shown are significant at the 99% level.

823

824 Figure 7: Modelled and observed 1992-2010 linear trends in ice concentration by season.  
825 Observed ice concentration is calculated using the Bootstrap algorithm (Comiso 2000).

826

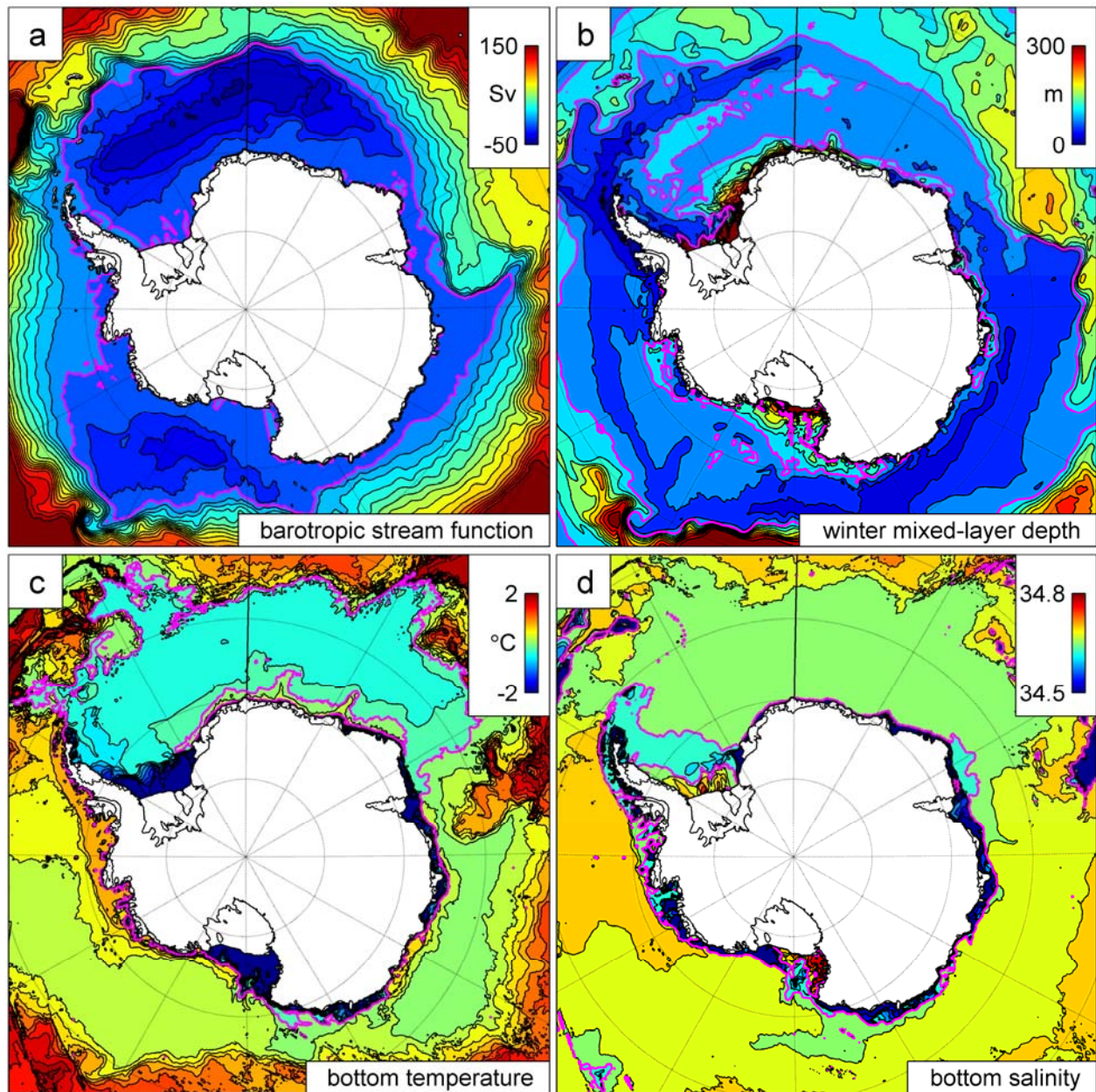
827 Figure 8: Modelled and observed 1992-2010 linear trends in ice concentration and drift for  
828 autumn and winter seasons. Observed ice concentration is calculated using the Bootstrap  
829 algorithm (Comiso 2000) and ice velocities are from passive microwave feature-tracking  
830 (Holland and Kwok 2012). Model velocities are shown every tenth grid point.

831

Figure 9: Modelled 1992-2010 linear trends in effective ice thickness and drift for autumn and winter seasons. Effective ice thickness is defined as volume of ice per unit area of ocean, neglecting the ice-borne snow layer. Model velocities are shown every tenth grid point. The largest trends, up to 5 cm/y, are in the Amundsen Sea in winter.

Figure 10: Modelled autumn (AMJ) 1992-2010 linear trends in effective ice thickness and related quantities. a) trends in modelled effective ice thickness and ERA-Interim wind stress (shown every tenth grid point); b) trends in evolution term in ice-thickness equation; c) trends in dynamic part of ice-thickness evolution; d) trends in thermodynamic part of ice-thickness evolution. The colourbar for panels c and d is the same as for panel b.

Figure 11: As Figure 10 but for winter (JAS).



845 Figure 1: Modelled mean 1992-2010 ocean fields. a) Barotropic stream function (contours  
 846 every 10 Sv, magenta contour 0 Sv), b) Winter (JJA) mean mixed-layer depth from KPP  
 847 calculation (contours every 25 m, magenta contour 100 m), c) Potential temperature at seabed  
 848 (contours every 0.2 °C, magenta contour 0 °C), d) Salinity at seabed (contours every 0.025,  
 849 magenta contour 34.65).

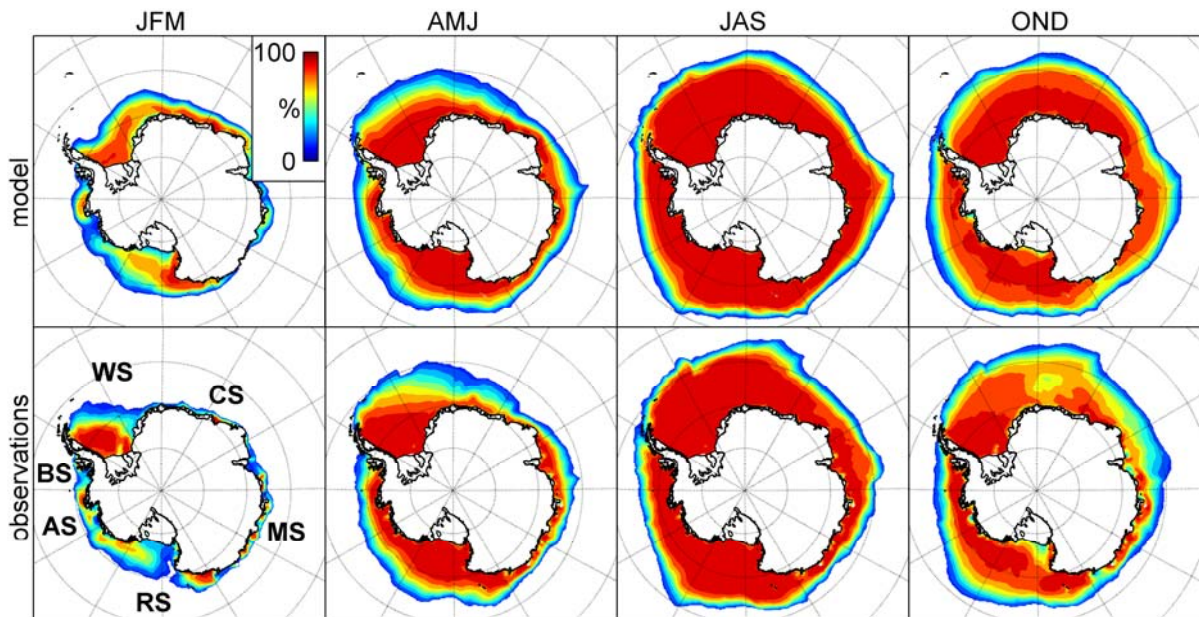


Figure 2: Modelled and observed 1992-2010 mean ice concentration by season. Observed ice concentration is calculated using the Bootstrap algorithm (Comiso 2000). WS: Weddell Sea, CS: Cosmonaut Sea, MS: Mawson Sea, RS: Ross Sea, AS: Amundsen Sea, BS: Bellingshausen Sea.



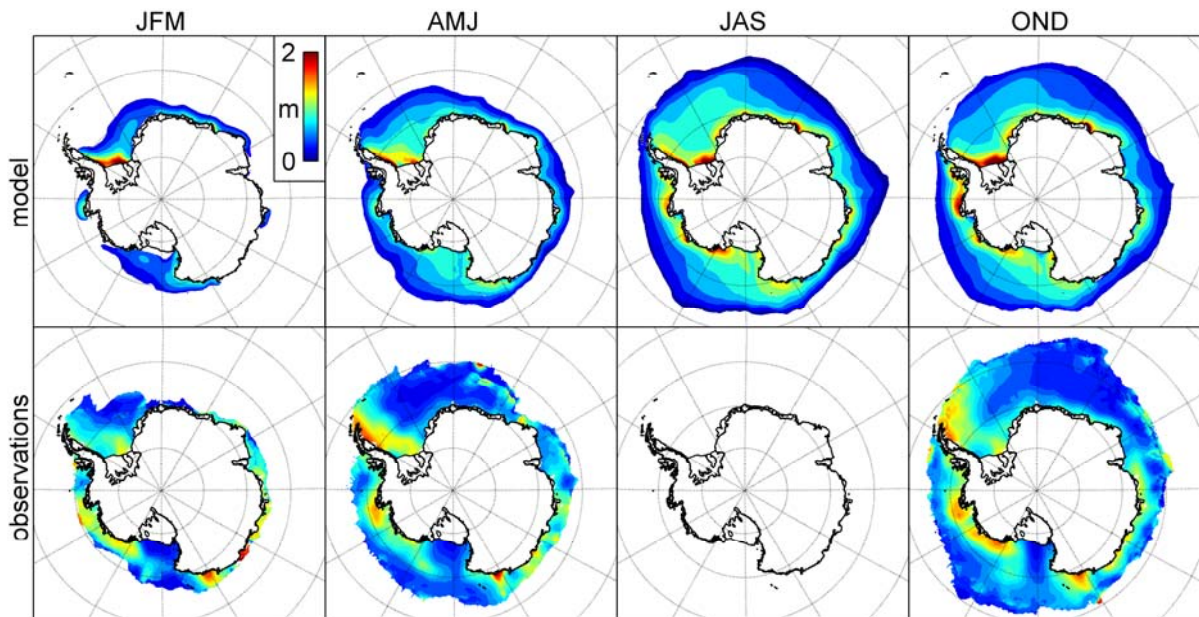


Figure 3: Modelled mean 1992-2010 effective ice thickness and observed mean 2003-2008 effective ice thickness by season. Effective ice thickness is defined as volume of ice per unit area of ocean, neglecting the ice-borne snow layer. Observed effective ice thickness is derived from ICESat measurements (Kurtz and Markus 2012). Areas with respective ice concentration below 0.5 are masked in both datasets.

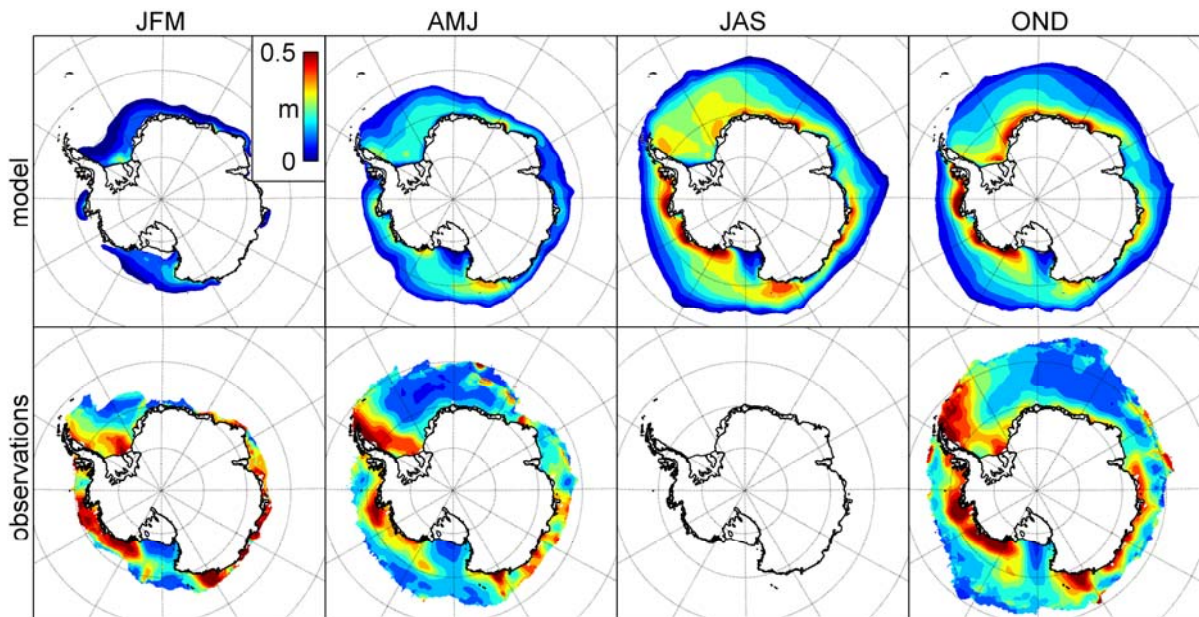


Figure 4: Modelled mean 1992-2010 effective snow thickness and observed mean 2003-2008 effective snow thickness by season. Effective snow thickness is defined as volume of ice-borne snow per unit area of ocean. Observed effective snow thickness is derived from ICESat measurements (Kurtz and Markus 2012). Areas with respective ice concentration below 0.5 are masked in both datasets.



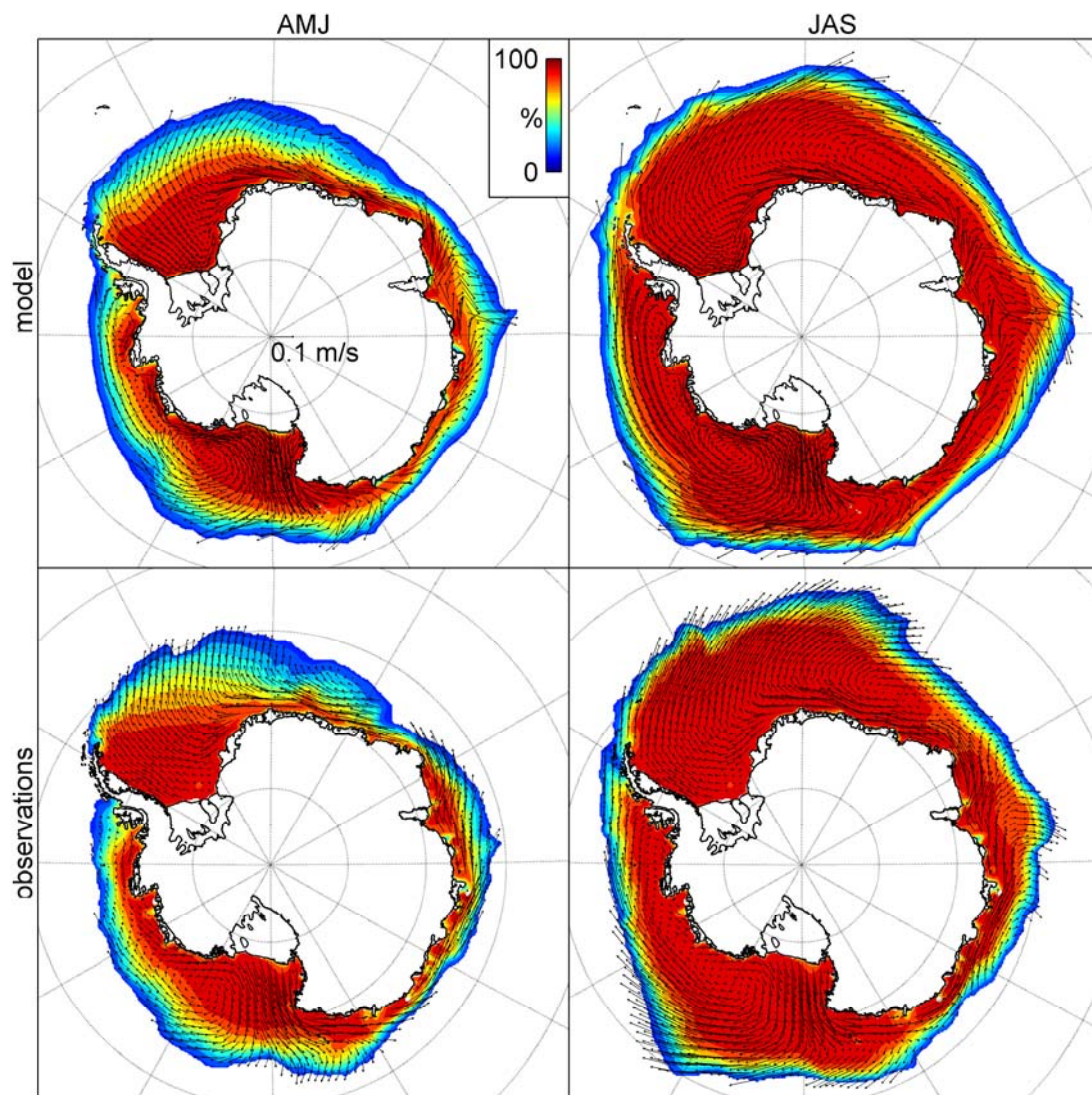


Figure 5: Modelled and observed 1992-2010 mean ice concentration and ice drift for autumn and winter seasons. Observed ice concentration is calculated using the Bootstrap algorithm (Comiso 2000) and ice velocities are from passive microwave feature-tracking (Holland and Kwok 2012). Model velocities are shown every tenth grid point.

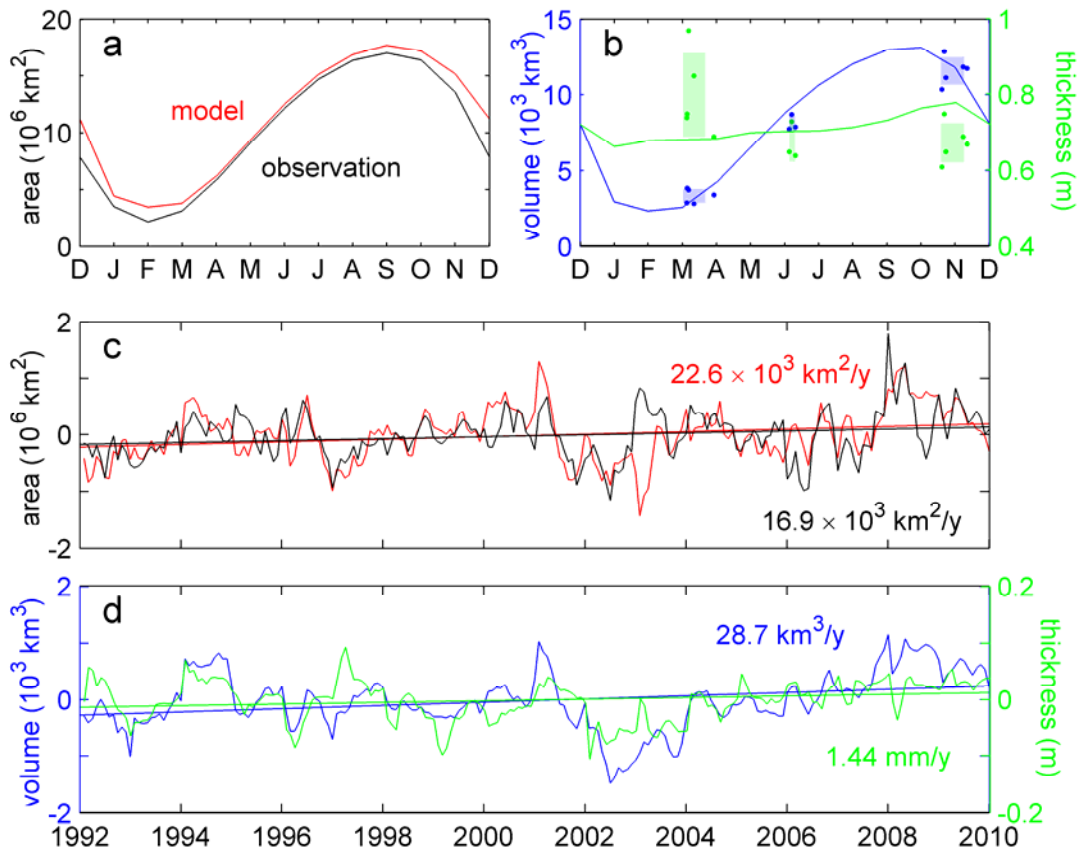


Figure 6: 1992-2010 temporal variability of total Antarctic sea ice variables from model and observation. a) mean seasonal cycle in total ice area (the area integral of ice concentration) for model and observations (Comiso 2000). b) mean seasonal cycle in total ice volume and mean ice thickness (total ice volume divided by total ice area) for model and observations (dots represent individual ICESat campaigns, shaded areas represent interannual mean  $\pm$  standard deviation for each season; Kurtz and Markus (2012)). c) monthly anomalies in modelled and observed total ice area from respective climatologies in panel a. d) monthly anomalies in modelled total ice volume and mean ice thickness from respective climatologies in panel b. All trends shown are significant at the 99% level.

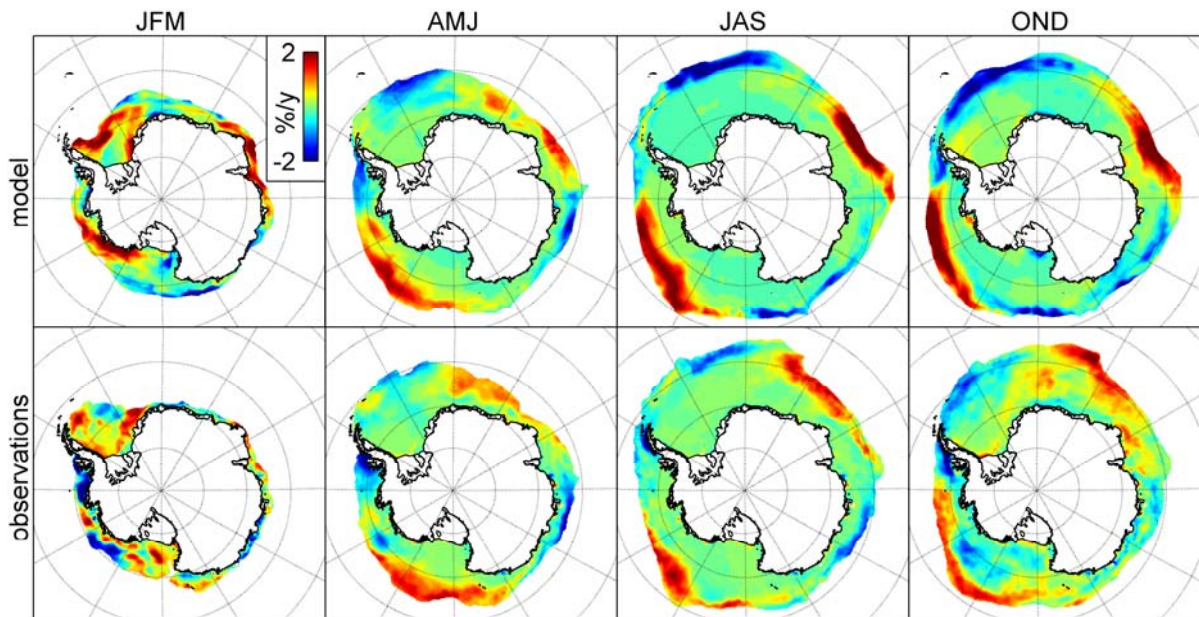


Figure 7: Modelled and observed 1992-2010 linear trends in ice concentration by season. Observed ice concentration is calculated using the Bootstrap algorithm (Comiso 2000).



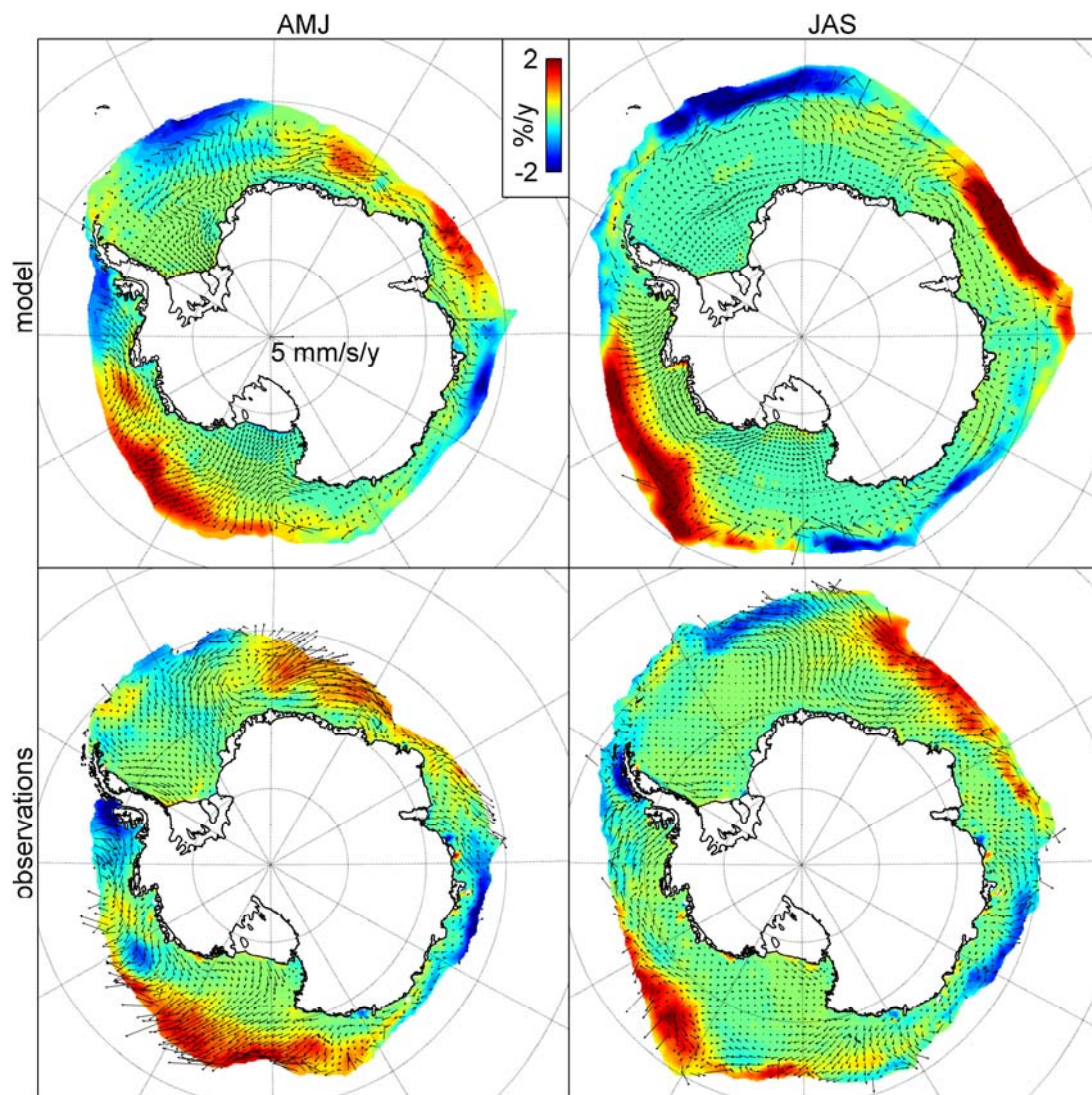
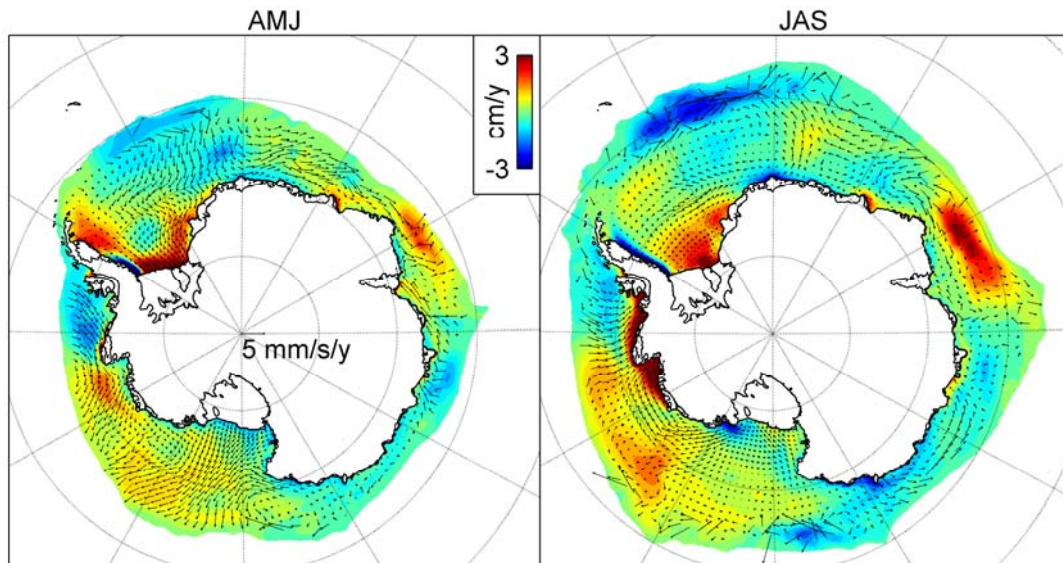
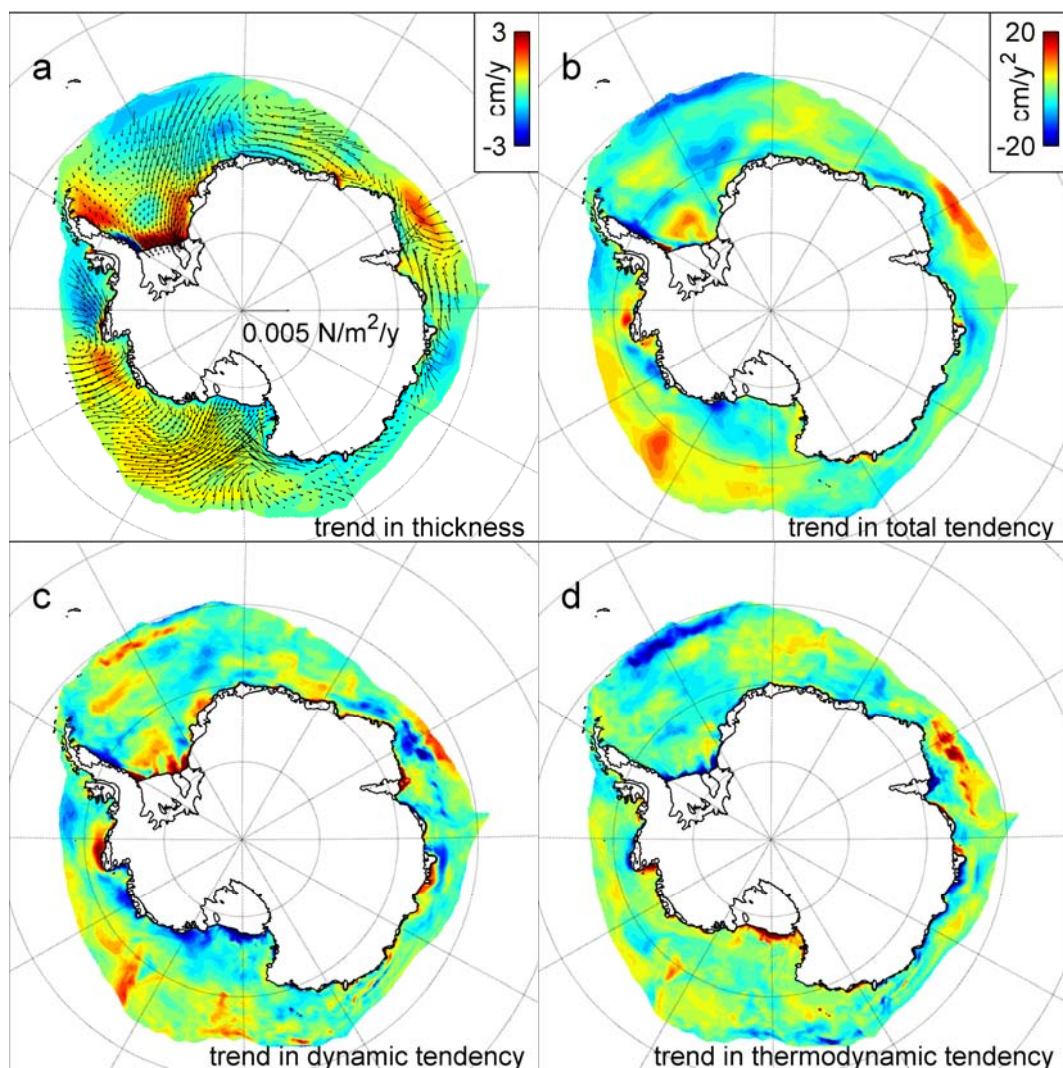


Figure 8: Modelled and observed 1992-2010 linear trends in ice concentration and drift for autumn and winter seasons. Observed ice concentration is calculated using the Bootstrap algorithm (Comiso 2000) and ice velocities are from passive microwave feature-tracking (Holland and Kwok 2012). Model velocities are shown every tenth grid point.



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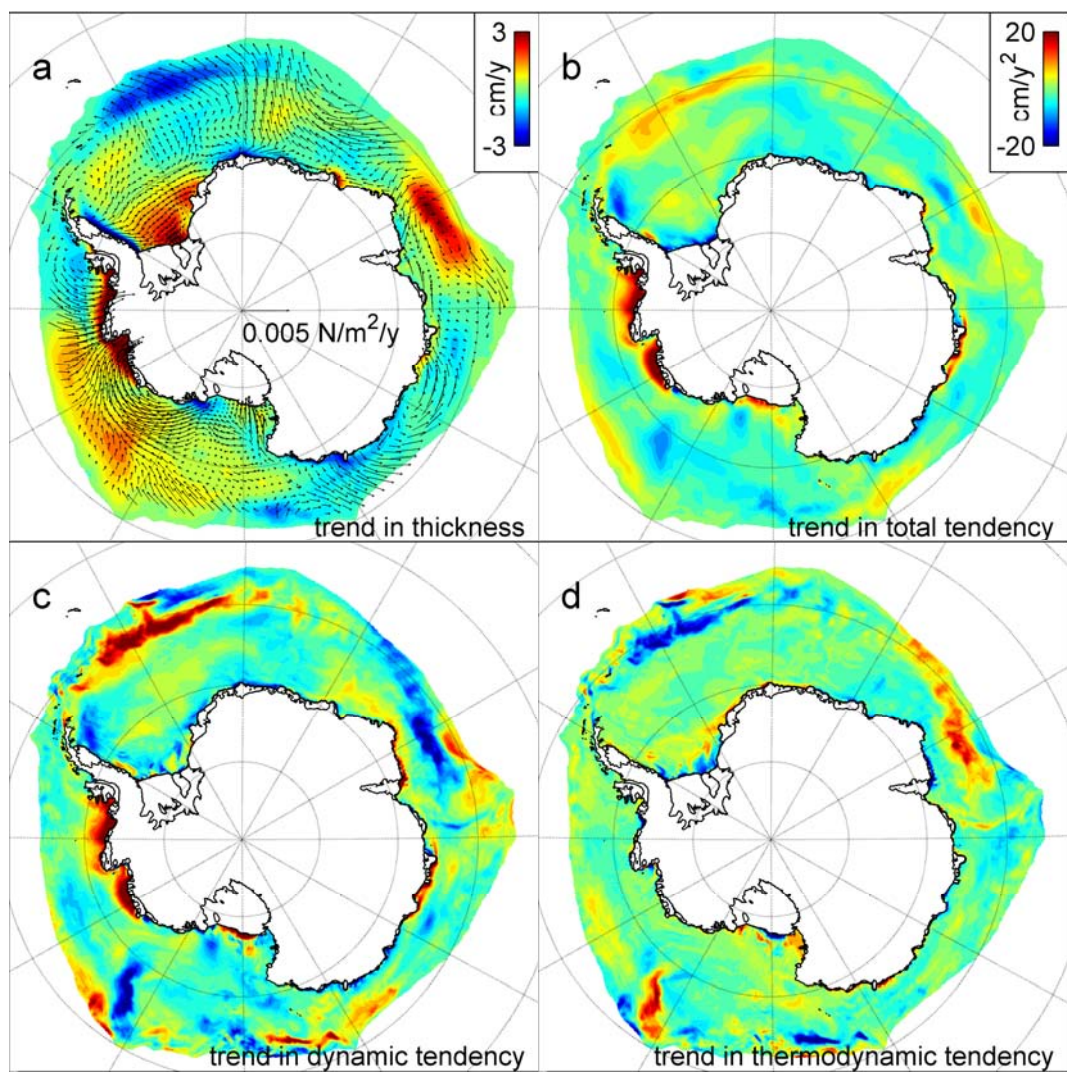
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900





901 Figure 11: As Figure 10 but for winter (JAS).